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Cognitive engagement in the problem-based learning classroom

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Abstract The objective of the present study was to examine to what extent autonomy in problem-based learning (PBL) results in cognitive engagement with the topic at hand. To that end, a short self-report instrument was devised and validated. Moreover, it was examined how cognitive engagement develops as a function of the learning process and the extent to which cognitive engagement determines subsequent levels of cognitive engagement during a one-day PBL event. Data were analyzed by means of confirmatory factor analysis, repeated measures ANOVA, and path analysis. The results showed that the new measure of situational cognitive engagement is valid and reliable. Furthermore, the results revealed that students' cognitive engagement significantly increased as a function of the learning event. Implications of these findings for PBL are discussed.

Keywords Autonomy · Cognitive engagement · Confirmatory factor analysis · Path analysis · Problem-based learning

Introduction

Cognitive engagement in the classroom can be characterized as a psychological state in which students put in a lot of effort to truly understand a topic and in which students persist studying over a long period of time. The present study is about this kind of cognitive engagement and how it emerges in the problem-based learning (PBL) classroom.

PBL is an approach to higher education that has the following characteristics. Small groups of students discuss a problem guided by a tutor. Based on the discussion about the problem, students generate learning goals for subsequent self-directed learning. As such, students have a choice in deciding which learning goals they would pursue in order to

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adequately deal with the problem. After a period of self-directed learning, students share what they have learned about the topic and test whether their new understanding of the problem is now more accurate and elaborate than before. Once students are satisfied with their learning outcomes, they engage with a new problem and the cycle starts all over again (Hmelo-Silver 2004; Schmidt 1993).

PBL can be interpreted as a form of cognitive-constructivist learning, based on at least three assumptions (Schmidt et al. 2009). The first assumption is that in PBL students engage in *theory construction*. With the help of their peers they develop an initial theory about the phenomena described in the problem. Subsequently, self-directed learning activities (e.g. reading books or consulting internet resources) serve to test the initial theory against the literature thereby elaborating and changing and deepening their understanding of the topic. The second assumption is that the use of authentic problems or real-life problems encourage students to become *interested in the topic at hand* and as a consequence helps them gaining a deeper understanding of the principles or processes underlying the problem. The third assumption is that being in the position to identify one's own learning goals in collaboration with peers fosters a feeling of *autonomy, agency, and empowerment*. Being autonomous from the direct intervention of a teacher and feeling in charge of one's own learning is supposed to result in increased cognitive engagement with the topic to be learned, which eventually encourages deeper understanding of it.

There is some empirical evidence suggesting that what students do in the tutorial group is indeed attempting to construct a mental model or "theory" that explains the phenomena described in the problem. For instance, De Grave et al. (2001) showed students videos of their own contributions to a tutorial discussion and asked them to recall what they were thinking. This stimulated recall procedure in combination with verbatim transcripts of the verbal interaction in the group suggested that indeed theory building, and to a lesser extent, data exploration and hypothesis evaluation were central to the thoughts and verbal utterances of the students.

Support for the second assumption, i.e. that the authentic character of the problems results in higher levels of student interest, can be found in a study by Rotgans et al. (2010). In their study they examined whether there are differences in students' interest between a problem-based learning and a conventional, direct-instruction, primary school mathematics classroom. The results showed that the problem-based group, which worked on an authentic problem, was significantly more interested in a particular subject than the direct-instruction group that worked on more abstract mathematical examples and definitions of the same subject.

The third assumption, namely that autonomy in learning leads to more extensive cognitive engagement, has not been studied to the same extent as the previous ones. Following suggestions in the self-determination literature, Deci (1992) has proposed that classrooms that promote student autonomy and choice increase student's engagement with the task at hand (see also Cordova and Lepper 1996). Deci et al. (1991) pointed out that choice has a positive effect on interest and engagement because people have an innate psychological need for competence, belonging, and autonomy. In self-determination research, having a choice is a means to satisfy that need for autonomy. In the PBL classroom students have the choice to determine what they wish to study (i.e. select their own learning goals and conduct their individual self-study), which, according to self-determination theory, should lead to a feeling of autonomy. Feeling autonomous and empowered in the classroom is expected to have a motivating effect encouraging students to engage themselves cognitively with the task at hand. Following this line of thought, we hypothesized that when students feel autonomous (from the tutor and the team members) they would display more

cognitive engagement with the task. We expected that this would most likely happen when students are in charge of their own learning during individual self-study.

Cognitive engagement is defined as the extent to which students' are willing and able to take on the learning task at hand. This includes the amount of effort students are willing to invest in working on the task (Corno and Mandinach 1983), and how long they persist (Richardson and Newby 2006; Walker et al. 2006). Cognitive engagement has traditionally been operationalized by measuring the extent of students' homework completion, class attendance, extra-curricular participation in activities, or their general interactions with the teachers, and how motivated they seem while engaging in classroom discussions (Appleton et al. 2006). This description of cognitive engagement suggests that it is considered by most authors a more or less stable trait of students, independent of the context. We suggest that cognitive engagement is more or less dependent on the task at hand because the task determines the extent of students' autonomy. For instance, working with groups and engaging in discussions, searching for information on the internet, or listening to a lecture is likely to result in different levels of cognitive engagement because of different levels of autonomy. Listening to a lecture is arguably the least cognitively engaging since under such circumstances there is little to no student autonomy. On the other hand, when students independently search for information on the internet—that is, when students engage in self-initiated information-seeking behaviors—the level of autonomy should be relatively high and thus lead to more cognitive engagement. Working in groups and engaging in discussions could result in either high or low feelings of autonomy, depending on the group dynamics. For example, if there are domineering peers in the group, a student may feel less autonomous and engages less cognitively as opposed to a group that works well together. In short, we suggest that the level of autonomy is inherently related to an activity or task and largely determines the degree to which students engage cognitively with that activity or task.

As a consequence, if the task parameters change during a learning event—as it is the case in PBL—one would expect that students perceive different levels of autonomy and consequently engage differently. For instance, in PBL during the initial phase of defining the problem, students have to work in teams under the guidance of a tutor. During this phase one could expect that students' autonomy would be relatively low. However after this, students undertake independent self-study, during which one could expect that their autonomy would be relatively higher and thus they would be more cognitively engaged. After this, students converge and share their findings, which would result again in a decrease of autonomy and cognitive engagement.

To test whether this is indeed the case, one has to be able to measure changes in cognitive engagement over a learning event. Existing instruments are designed to measure generally more stable, trait-like cognitive engagement, which means that the grain size of these instruments is too large to pick up fairly small contextual variations. For instance, Appleton and colleagues developed the *Student Engagement Instrument* or SEI, (Appleton et al. 2006) to measure students' cognitive engagement (perceived relevance of school) and psychological engagement (perceived connection with others at school). Although the SEI goes beyond the conventionally used broad indicators of engagement, such as homework completion, attendance, and extracurricular participation, the instrument's grain size is still too large to adequately measure contextual changes in engagement over a learning event. This becomes apparent when examining the items of the SEI, which are rather broad and related to school engagement in general (e.g. "I enjoy talking to the teachers here", "Most of what is important to know you learn in school", "Learning is fun because I get better at something", "What I'm learning in my class will be important in my future", and "I feel like I have a say about what happens to me at school").

The same applies to a study conducted by Ahlfeldt et al. (2005) in which they used various elements of the National Survey of Student Engagement (Carini et al. 2006; Kuh 2001) to measure student engagement in the classroom. Although the authors only selected items from the National Survey of Student Engagement that in their view measured student engagement at the classroom level with relation to collaborative learning, cognitive development, and personal skills development, the grain-size of the items is again too large to pick up context-dependent variations during the lesson itself (e.g. “I worked with classmates outside of class to complete class assignments”, “To what extent has this course emphasized the mental activities listed below?” “Memorizing facts, ideas or methods from your course and readings so you can repeat them in almost the same form”).

Due to the absence of more specific cognitive engagement measures, researchers also resorted to using scales and sub-scales from existing instruments, which to some degree resemble cognitive engagement. In numerous studies, researchers adapted self-regulated learning strategy scales (e.g. DeBacker and Crowson 2006; Dupeyrat and Mariné 2005; Meece et al. 1988; Metallidou and Vlachou 2007). For instance, Metallidou and Vlachou (2007) used various self-regulatory learning sub-scales from the *Motivated Strategies of Learning Questionnaire* (Pintrich et al. 1991) such as rehearsal, elaboration, and organizational strategies, as a measure of students’ cognitive engagement. Although we agree that learning strategies manifest themselves in different forms of cognitive engagement, we have reservations whether it is admissible to simply rename self-regulated learning constructs and use them as measures of cognitive engagement.

Considering that there seem to be no suitable instruments available to fit the objectives of the present study to measure cognitive engagement as it happens in the classroom (in real time), we saw the need to construct and validate a short self-report questionnaire to determine students’ “*situational* cognitive engagement”. To differentiate this new measure from more general traditional measures of cognitive engagement, as discussed above, we added the designation “situational” to stress the contextual dependence of this measure. The new situational cognitive engagement measure is composed of three overlapping facets: (1) how students perceive their present engagement with the task, (2) how they rate their effort and persistence while working on the task, and (3) how much they feel absorbed by the learning task, for instance, whether it makes them forget everything around them. It is important to note that all three facets measure *ongoing* cognitive engagement and try to capture the activity of being engaged. This is conceptually different from existing measures of cognitive engagement, which are typically administrated at the end of the course or a semester and require students to make summative judgments of how engaged they generally were during a particular course spanning several weeks. To capture the dynamic aspect of engagement during class, we generated items that measure students’ effort (Blumenfeld et al. 2006; Corno and Mandinach 1983; Volet 1997; Wolters 1999) and how willing they are to persist on the task at hand (Ainley et al. 2002; Pintrich and De Groot 1990; Prenzel 1992; Richardson and Newby 2006; Walker et al. 2006). As an ultimate form of being engaged in learning we added an item measuring flow, that is, being fully emerged in learning and forgetting everything around oneself (Csikszentmihalyi 1975; Csikszentmihalyi and Csikszentmihalyi 1988).

The first objective of the present study was to establish the construct validity of this new measure (Study 1). To test whether students’ cognitive engagement changes during PBL, we administered the situational cognitive engagement measure five times during a 1-day PBL event at a polytechnic in Singapore (Study 2). Eleven applied-science classes participated in the study. Students worked on one problem during the course of 1 day. At the polytechnic the PBL day is divided into five distinct learning phases: (1) the problem

definition phase (i.e. initial theory construction and identification of learning goals); (2) Initial self-study (i.e. students do a preliminary search, or self-study, to verify their hypothesized theory to explain the problem and to verify the adequacy of identified learning goals); (3) Initial findings sharing phase (i.e. student share the insights gained during the preliminary self-study and the tutor may contribute by asking questions to help students further structure their learning goals); (4) Self-study phase (i.e. student engage in further individual self-study to look for answers to the identified learning goals); and (5) Presentation and elaboration phase (i.e. student share their insights gained during self-study, synthesize their findings, and evaluate whether they have addressed all learning goals adequately). After each phase we administered the situational cognitive engagement measure. We expected the following pattern to emerge: During the phases in which students come together as a team, their cognitive engagement would be fairly low because contributions of peers and their tutor may constrain the level of autonomy experienced. On the other hand, if students do individual self-study, their autonomy would be higher and so does their level of cognitive engagement. Therefore, we expected to observe a wave-like pattern for cognitive engagement during the day; depending on the particular phase of the learning process engagement would start at a fairly low level, subsequently increase and then decrease, followed by another wave of increase and decrease.

Study 1

The objective of the first study was to establish the reliability and construct validity of a short measure of situational cognitive engagement. To that end, we administered a four item self-report measure after students had completed the first phase of the PBL-cycle: the problem-definition phase. The construct validity was established by means of confirmatory factor analysis of two samples: (1) an exploration sample, and (2) a cross-validation sample. This approach is in line with common practices in SEM (Byrne 2001). We computed the reliability of the scale by calculating the coefficient H (Hancock and Mueller 2001).

Method

Participants

Two samples were used in the validation study: (1) a smaller *exploration sample* ($N = 61$) for instrument construction and (2) a larger *confirmation sample* ($N = 312$) for cross-validation of the instrument. The average age of the participants for the exploration sample (62% female) was 20 years ($SD = .98$). The average age of the participants for the cross-validation sample (52% female) was 20 years ($SD = 1.45$). All students were enrolled in science-related modules at a polytechnic in Singapore.

Educational context

In this polytechnic, the instructional method is problem-based learning (PBL) for all its modules and programs. In this approach five students work together in one team under the guidance of a tutor. Each class comprises four to five teams. Unique to this polytechnic's

approach to PBL is that students work on one problem during the course of each day (Alwis and O'Grady 2002). This means that students deal with one problem each day in all modules. A typical day starts with the presentation of a problem. Students discuss in their teams what they know, do not know, and what they need to find out. By doing so, students activate their prior knowledge, come up with tentative explanations for the problem, and formulate their own learning goals. Subsequently, a period of self-study follows in which students individually and collaboratively try to find information to address the learning goals (Hmelo-Silver 2004; Schmidt 1983, 1993; Schmidt et al. 2009). At the end of the day the five teams come together to present, elaborate, and synthesize their findings.

Measure

A measure of students' situational cognitive engagement was devised which consisted of three elements, measured by four items: (1) engagement with the task at hand (item: "*I was engaged with the topic at hand*"), (2) effort and persistence (item: "*I put in a lot of effort*"; "*I wish we could still continue with the work for a while*"), and (3) experience of flow or having been totally absorbed by the activity (item: "*I was so involved that I forgot everything around me*") (Csikszentmihalyi 1975; Krapp and Lewalter 2001; Prenzel 1992; Schraw et al. 2001). The items were scored on a 5-point Likert scale: 1 (*not true et al for me*), 2 (*not true for me*), 3 (*neutral*), 4 (*true for me*), and 5 (*very true for me*).

Procedure

The situational cognitive engagement measure was administered after the problem-definition phase, that is, after students had engaged in theory construction and after they had generated learning goals. The problem-definition phase took about 20 min. Responding to the questionnaire took about 20 s. After we had completed the validation with the exploration data, we repeated the validation procedure for a different sample, the cross-validation sample. Cross-validation is a necessary step in establishing the construct validity of new measure because it allows the researcher to test how stable the measure is in different contexts and samples.

Analysis

The construct validity of the situational cognitive engagement measure was established by means of confirmatory factor analysis (Byrne 2001). With the present study we did not intend to study consequential or predictive validity. The assumption was that all four items were manifestations of one underlying factor. Parameter estimates were generated using maximum likelihood and tests of goodness of fit. Chi-square accompanied by degrees of freedom, sample size, *p*-value and the root mean square error of approximation (RMSEA) were used as indices of absolute fit between the models and the data. The Chi-square is a statistical measure to test the closeness of fit between the observed and predicted covariance matrix. A small Chi-square value, relative to the degrees of freedom, indicates a good fit (Byrne 2001). A Chi-square/*df* ratio of less than 3 is considered to be indicative of a good fit. RMSEA is sensitive to model specification and is minimally influenced by sample size and not overly affected by estimation method (Fan et al. 1999). The lower the RMSEA value, the better the fit. A commonly reported cut-off value is .06 (Hu and Bentler 1999). In addition to these absolute fit indices, the comparative fit index (CFI) was calculated.

The CFI value ranges from zero to one and a value greater than .95 is conventionally considered a good model fit (Bentler 1990; Byrne 2001). The reliability of the measure was determined by calculating Hancock's coefficient H . The coefficient H is a construct reliability measure for latent variable systems that represents a relevant alternative to the conventional Cronbach's alpha. According to Hancock and Mueller (2001) the usefulness of Cronbach's alpha and related reliability measures is limited to assessing composite scales formed from a construct's indicators, rather than assessing the reliability of the latent construct itself as reflected by its indicators. The coefficient H is the squared correlation between a latent construct and the optimum linear composite formed by its indicators. Unlike other reliability measures the coefficient H is never less than the best indicator's reliability. In other words, a factor inferred from multiple indicator variables should never be less reliable than the best single indicator alone. Hancock recommended a cut-off value for the coefficient H of .70.

Results and discussion

First, the exploration sample was analyzed. The model fit statistics showed that the data fitted the hypothesized model very well. The Chi-square/ df ratio was .17, $p = .84$, CFI = 1.00 and RMSEA = .00. All factor loadings were statistically significant and ranged from .51 to .96, with an average of .70. See Table 1 for an overview of the results.

We then cross-validated the model with a larger sample. The results revealed that the data fitted the model equally well. The Chi-square/ df ratio was .02, $p = .94$, CFI = 1.00 and RMSEA = .00. All factor loadings were statistically significant and ranged from .38 to .85, with an average of .58.

The reliability for both samples was determined by calculating Hancock's coefficient H . The coefficient H for the exploration sample was .93 and for the cross-validation sample .78. Overall, the results demonstrate that for both independent samples the psychometric characteristics of the situational cognitive engagement measure are adequate.

Study 2

The first objective of Study 2 was to examine the degree to which students are cognitively engaged during PBL across the five PBL phases: (1) the problem definition phase; (2) Initial self-study; (3) Initial findings sharing phase; (4) Self-study phase; and (5) Presentation and elaboration phase. We expected that cognitive engagement during the first phase would be relatively low; then it would increase during the first self-study phase;

Table 1 Model fit statistics of the situational cognitive engagement measure for the exploration and cross-validation samples

Statistics	Exploration sample	Cross-validation sample
Chi-square/ df	.17	.02
p -Value	.84	.94
CFI	1.00	1.00
RMSEA	.00	.00
Standardized betas	.73; .96; .51; .61	.57; .85; .38; .53
Coefficient H	.93	.78

decrease again during group discussion; increase during the longer self-study phase; and eventually decrease again during the presentation and elaboration phase. This hypothesis was based on the assumption that when students come together in the team and with the tutor, their autonomy would be relatively lower because of the constraints on choice provided by group and tutor. Under this hypothesis, during self-directed learning their level of cognitive engagement would be relatively higher.

The second objective of this study was to examine the extent to which situational cognitive engagement in one phase determines a students' cognitive engagement during a next phase. We hoped to find answers to the questions: does it matter how cognitively engaged student are during the problem definition phase in predicting their subsequent engagement during self-study? Or, does the initial self-study phase predict students' cognitive engagement during the second, more elaborate self-study phase?

Method

Participants

The sample consisted of 208 participants (51% female) from an applied science module at the same polytechnic as in Study 1. The participants' average age was 20 years ($SD = 1.45$).

Measures

Situational cognitive engagement

The measure for students' situational cognitive engagement validated in Study 1 was administered for this study. All items were scored on a 5-point Likert scale: 1 (*not true at all*), 2 (*not true for me*), 3 (*neutral*), 4 (*true for me*), and 5 (*very true for me*). The coefficient H for all five cognitive engagement measurements ranged from .70 to .79 (average = .77).

Academic achievement

Academic achievement was determined by means of students' course grades. The course grades were based on the results of written achievement tests and class performance.

Procedure

The situational cognitive engagement measure was administered during the five phases in the 1-day PBL process (see Fig. 1 for an overview of the administration during the day).

The first administration took place after the problem-definition phase in which they generated learning goals. The second administration was after the initial self-study phase. In this phase students did an initial search in the learning resources or the internet to verify whether their initial theories about the problem were correct. The students then converged and had a quick discussion with the group to share their initial findings. A tutor was present during this session and engaged in questioning the students about their findings and whether their learning goals adequately address the problem. Subsequently, the situational

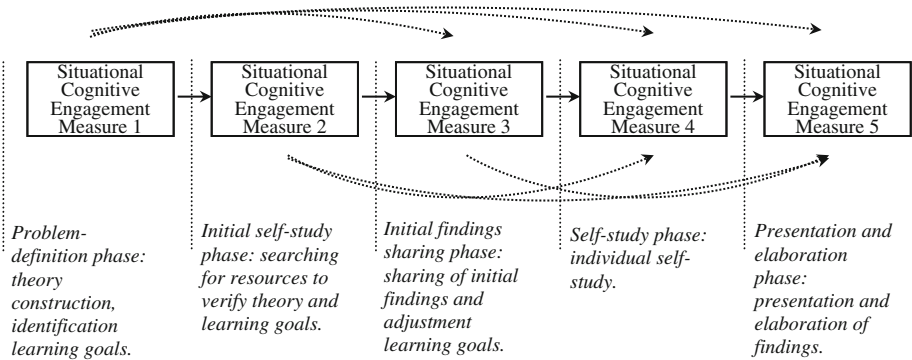


Fig. 1 Measurement occasions of the situational cognitive engagement measure during a 1-day problem-based learning process

cognitive engagement measure was administered for the third time. Student then went out for 2-h self-study after which the fourth situational cognitive engagement measure was administered. Students shared their findings and engaged in elaboration about the problem and whether they have adequately addressed all learning goals. After this, the engagement measure was administered for the fifth and last time.

Analysis

As a first step in the analysis, we generated zero-order correlations to inspect how the five repeated measurements of situational cognitive engagement are related. Moreover, we calculated mean values of all five measurements. Potential mean level differences between the measurements were determined by means of a one-way repeated measures ANOVA with LSD comparisons of the means. Subsequently, the relationships between the five situational cognitive engagement measurement occasions were analyzed using path analysis. In the path analysis, we tested a sequential causal model (see Fig. 1). This entails that one measurement leads to the next: situational cognitive engagement measure 1 leads to situational cognitive engagement measure 2, situational cognitive engagement measure 2 leads to 3, and so on. To allow for the possibility that the relationships are not entirely sequential, e.g. early engagement may lead to engagement later on during the day, we first tested an explanatory model which allowed for all possible relationships (see Fig. 1, dotted lines). In the final model reported in the Results and Discussion section we only retained the relationships, which were statistically significant; all non-significant relationships were removed. For the model, Chi-square accompanied with degrees of freedom, p -value, and the root mean square error of approximation (RMSEA) were used as indices of absolute fit between the models and the data.

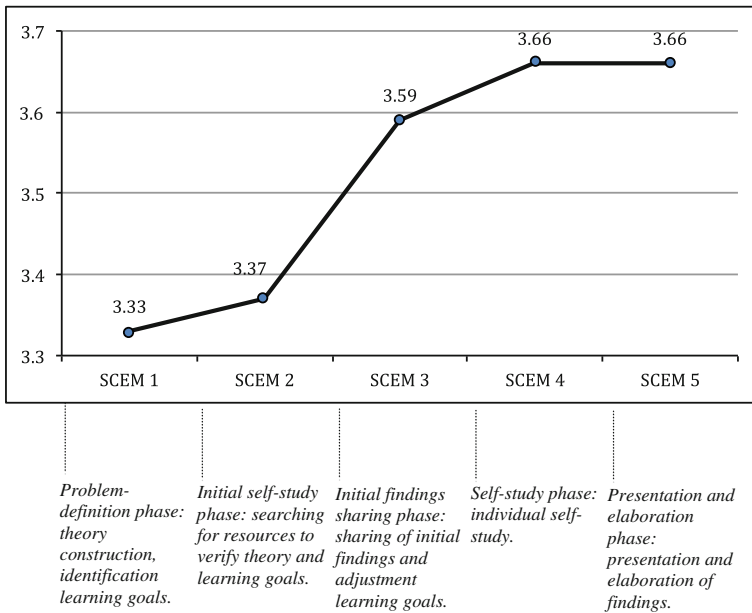
Results and discussion

First, intercorrelations between the five measurement occasions were calculated (see Table 2). All correlation coefficients were statistically significant and were medium to strong, ranging from .15 to .88, suggesting that the level of cognitive engagement in one

Table 2 Intercorrelations between the situational cognitive engagement measurements and academic achievement during one-day problem-based learning

Measurements	(1)	(2)	(3)	(4)	(5)	(6)	M (SD)
(1) Situational Cognitive Engagement Measure 1	–	.68**	.58**	.52**	.57**	.15*	3.33 (.53)
(2) Situational Cognitive Engagement Measure 2		–	.64**	.60**	.68**	.17*	3.37 (.54)
(3) Situational Cognitive Engagement Measure 3			–	.79**	.78**	.25**	3.59 (.61)
(4) Situational Cognitive Engagement Measure 4				–	.88**	.28**	3.66 (.62)
(5) Situational Cognitive Engagement Measure 5					–	.21**	3.66 (.61)
(6) Academic achievement						–	3.14 (.66)

** Statistically significant at the 1% level, * statistically at the 5% level

**Fig. 2** Mean values of the situational cognitive engagement measurements (SCEM) during a 1-day problem-based learning event

situation is associated with another during the one-day PBL process as well as students' academic achievement (i.e. course grades at the end of the semester).

The repeated measures one-way ANOVA revealed that there were significant differences between the five situational cognitive engagement measurements in absolute sense: $F(4,207) = 47.53$, $p < .01$ (eta-squared = .19). The pairwise LSD comparisons revealed that the first two measurements were not significantly different (see Fig. 2: $M(1) = 3.33$ vs. $M(2) = 3.37$, $p = .24$).

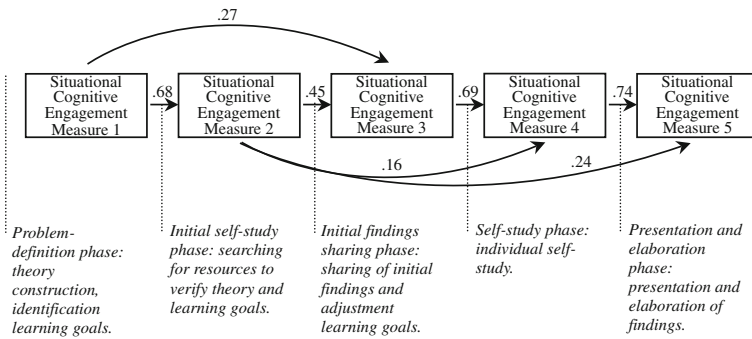


Fig. 3 Causal relationships between the five measurement occasions of situational cognitive engagement during a 1-day PBL event. *Note:* Numbers above the arrows represent standardized regression weights. All standardized regression weights are statistically significant at the 1% level

This outcome suggests that there is not a significant difference in the cognitive engagement phases when students generate theories and learning goals and do an initial search in the resources to verify their initial theories to explain what is going on in the problem. However, after that, when the students come together and discuss what they have found during the initial self-study phase, their level of cognitive engagement increased significantly ($M(1) = 3.33$ vs. $M(3) = 3.59$, $p < .01$ and $M(2) = 3.37$ vs. $M(3) = 3.59$, $p < .01$). The results suggest that students' level of cognitive engagement increases not so much during the initial self-study phase, as we had expected, but when they come together and share their findings with each other and the tutor. After this, students engaged in self-study leading to another significant increase in cognitive engagement ($M(3) = 3.59$ vs. $M(4) = 3.66$, $p = .01$). After self-study students seemed to have reached a peak in cognitive engagement; during the presentation and elaboration phase their levels of cognitive engagement remained the same ($M(4) = 3.66$ and $M(5) = 3.66$, $p = .99$). Overall, the data suggests that during the PBL day cognitive engagement increases gradually and does not develop in a wave-like pattern as we had hypothesized.

As a next step in the analysis we investigated how the five cognitive engagement measurements were related to each other. For instance, does one level of cognitive engagement influences the next or does an earlier measurement predict a measurement during a later phase of the learning process. Figure 3 depicts the model with the path coefficients indicating the strength of relation between the measurements. The model fitted the data well: Chi-square/ df ratio = 2.06, $p = .10$, CFI = 1.00, and RMSEA = .07.

The results revealed that the cognitive engagement measurements are strongly related to each adjacent measure in time. That is, if a student is cognitively engaged during the problem definition phases he or she is likely to be engaged during the next phases as well. There were also some weaker non-sequential relationships, for instance, between the first measure and the second and the second and the fourth and fifth. Overall, 81% of the variance in the last situational cognitive engagement measure could be explained by the preceding ones.

General discussion

The objective of the present study was to examine the underlying assumption that students in PBL have a large degree of autonomy (i.e. when students engage in individual self-

study), which is expected to result in cognitive engagement with the topic at hand. We hypothesized that when students experience a feeling of being autonomous from the tutor or the group, they would engage more cognitively with the problem (Deci 1992; Deci and Ryan 2004; Deci et al. 1991). To test the extent to which this is the case we first devised and validated a short self-report instrument to measure students' situational cognitive engagement in the classroom. Subsequently, we examined how situational cognitive engagement develops as a function of the learning process in PBL and the extent to which situational cognitive engagement during the learning process determines subsequent levels of cognitive engagement. Data were collected from applied-science courses at a polytechnic in Singapore.

The results of the construct validation and cross-validation study suggest that the four-item instrument is a reliable and valid measure to determine students' situational cognitive engagement in the classroom. As such, we used it for the subsequent analyses. Following Self-determination theory (Deci and Ryan 2004) under which autonomy is defined as the degree to which individuals feel volitional and responsible for their initiation of their behavior (Williams 2004), we hypothesized that students would have the highest feelings of autonomy (and thus would engage more) during self-study because during self-study they are expected to feel most volitional in their actions and are most responsible for their learning (Assor et al. 2002; Deci 1992; Flowerday and Schraw 2003; Ryan and Deci 2000). Following this point of view we expected that when students meet with the group and the tutor their feeling of autonomy would be reduced (relative to self-study), leading to less cognitive engagement with the problem. Because students first meet with the group, then break away for initial self-study, meet again with the group and the tutor, break away for self-study, and finally meet again with the group and the tutor, we expected to observe a wave-like pattern of cognitive engagement to emerge during the one-day PBL event.

The results of our analyses did however not support this hypothesis. Students' cognitive engagement did not progress in a wave-like pattern, but it increased significantly and consistently over the day. Strongest evidence against our hypothesis is that students' situational cognitive engagement increased significantly not during the first self-study phase, but when students met with the group thereafter to discuss their findings. Situational cognitive engagement increased significantly again during the second self-study phase. Our data suggest that students' situational cognitive engagement is not influenced by changes in task demand and associated feelings of autonomy, but situational cognitive engagement is more a function of the learning event itself: if students progress with their learning in PBL, their situational cognitive engagement increases.

Considering this outcome, we offer an alternative hypothesis. We propose that students' feelings of autonomy and situational cognitive engagement *are a direct function of a students' knowledge construction*. During the early stages of the problem day (i.e. during the problem-definition phase), students struggle to come up with adequate theories to explain the phenomena described in the problem. Struggling to explain the problem is expected (and intended) because students lack relevant knowledge as they are supposed to engage in theory construction. At this stage students largely depend on the elaborations with the other team members and the questioning of the tutor. As such, choice and autonomy are expected to be generally low. However, as students gain a deeper understanding of the topic, they gradually depend less on the support of their peers and the tutor, because they have gained more knowledge to direct their own learning. With increasing knowledge, the knowledge of possible (learning) choices also increases, which translates into a feeling of autonomy and consequently higher levels of situational cognitive engagement.

In conclusion, we propose that indeed, autonomy plays a significant role in students' situational cognitive engagement during PBL. However, unlike we hypothesized, students' autonomy seems less dependent on the phases during which they alternatively meet the group and engage in self-study, but on the knowledge students gain during their learning. The progression of knowledge and understanding of the topic seems to determine students' autonomy and thus their increased situational cognitive engagement. In simple terms: more knowledge, more autonomy, more self-determination, more situational cognitive engagement.

This finding opens up new areas of research for self-determination theory. Reeve (2004) has proposed that there is empirical evidence to support two conclusions about self-determination theory and its significance for education: (1) autonomously-motivated students thrive in educational settings; and (2) students benefit when teachers support their autonomy. Indeed, there is considerable evidence linking these two factors to positive educational outcome, such as higher academic achievement (Boggiano et al. 1993; Misnerandino 1996), higher rates of retention (Vallerand and Blssonnette 1992; Vallerand et al. 1997), higher perceived competence (Ryan and Grolnick 1986), greater conceptual understanding (Boggiano et al. 1993; Flink et al. 1990), greater creativity (Amabile 1985; Koestner et al. 1984), and higher self-esteem (Deci et al. 1981; Ryan and Deci 2000). However, largely missing from the current research agenda is the consideration of the significant role knowledge may play in autonomy and autonomy-supportive behavior.

Needless to say, further research needs to be carried out to empirically test whether and how autonomy and knowledge (development) are interlinked. We suggest a fruitful approach would be to include, besides the situational cognitive engagement measure, a measure of students' autonomy and their factual knowledge in the investigation to examine how these three factors are related and how they develop during the stages of student learning in PBL.

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